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# What are Probability Survey Designs?

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# Types of Statistical Designs

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- **Experimental designs**
  - Random allocation of treatments
- **Observational studies**
  - Factor space designs
    - Gradient studies
  - Available sites
- **Survey designs**
  - Census
  - Probability survey
- **Response designs needed in all**

# Survey Design : Response Design

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- **Survey design is process of selecting sites at which a response will be determined**
  - Probability model for inference is based on the randomized selection process
  - Has a spatial component and may have a time component
- **Response design is process of obtaining a response at a site:**
  - A single index period during a year
  - Multiple periods during year: monthly, quarterly

# Response Design - What is It?

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- Once you have selected a site to visit, how do you sample it for the selected indicators?
- Response design can have both a temporal and a spatial dimension.
- Requires defining the “target population” for which the design is applicable.
- Ultimately, it includes how you collapse the measurements into an “indicator”

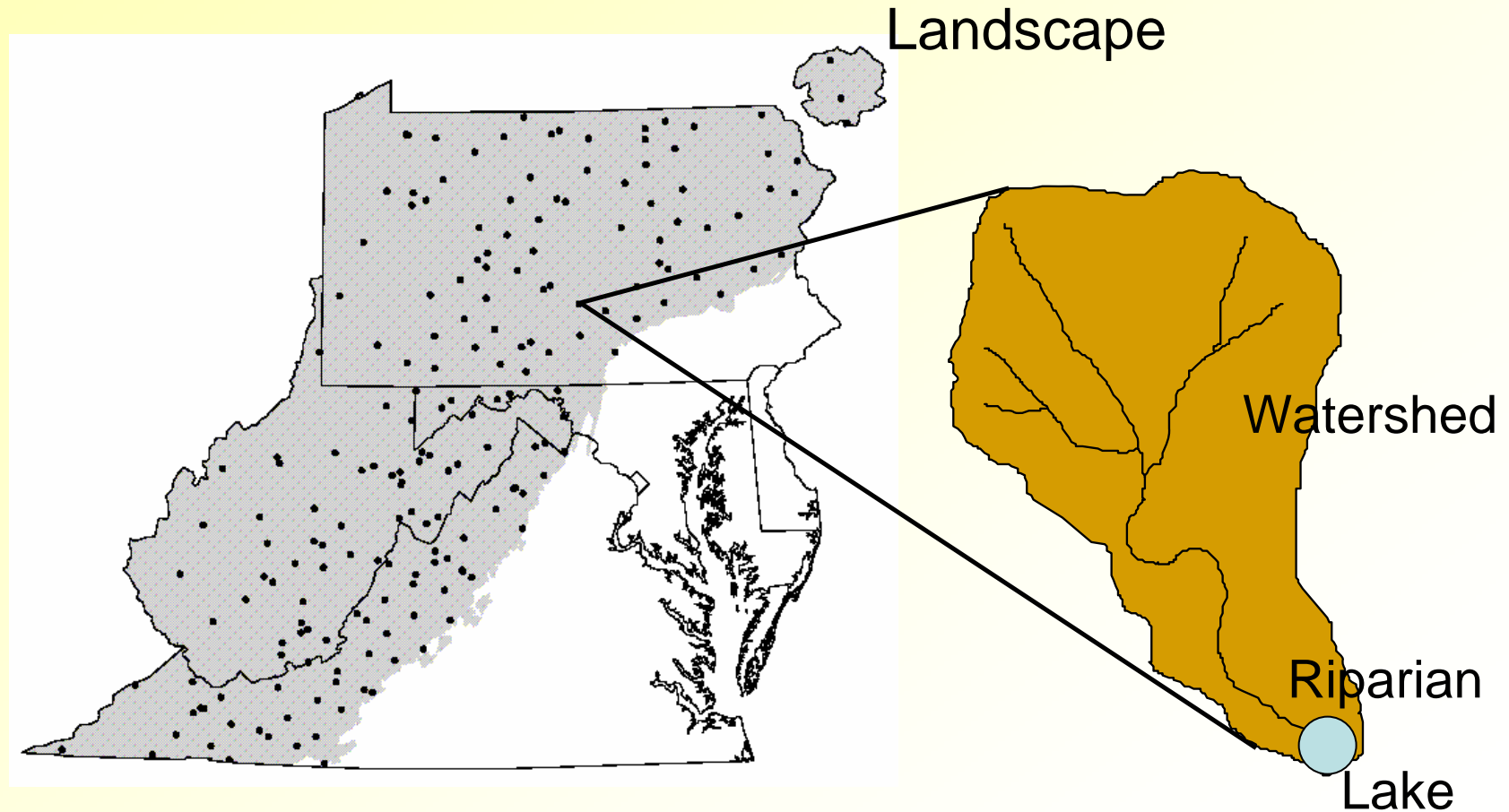


# The Response Design: Index Period

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- Time period within year selected for measurement (ecologically based)
- Measurements may be taken more than once during index period with response design giving protocol for obtaining single value for indicator
- Indicator variability within index period contributes to non-survey sampling error

# Lake Study Design: Response Design Scales



# Basic Spatial Survey Designs

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- **Simple Random Sample**
- **Systematic Sample**
  - Regular grid
  - Regular spacing on linear resource
- **Spatially Balanced Sample**
  - Combination of simple random and systematic
  - Guarantees all possible samples are distributed across the resource (target population)
  - Generalized Random Tessellation Stratified (GRTS) design

# Why Aren't Basic Designs Sufficient?

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- Monitoring objectives may include requirements that basic designs can't address efficiently
  - Estimates for particular subpopulations requires greater sampling effort
  - Administrative restrictions and operational costs
- Ecological resource occurrence in study region makes basic designs inefficient
  - Resource is known to be restricted to particular habitats



# Sample Survey Design

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## **Probability samples for ecological resources with:**

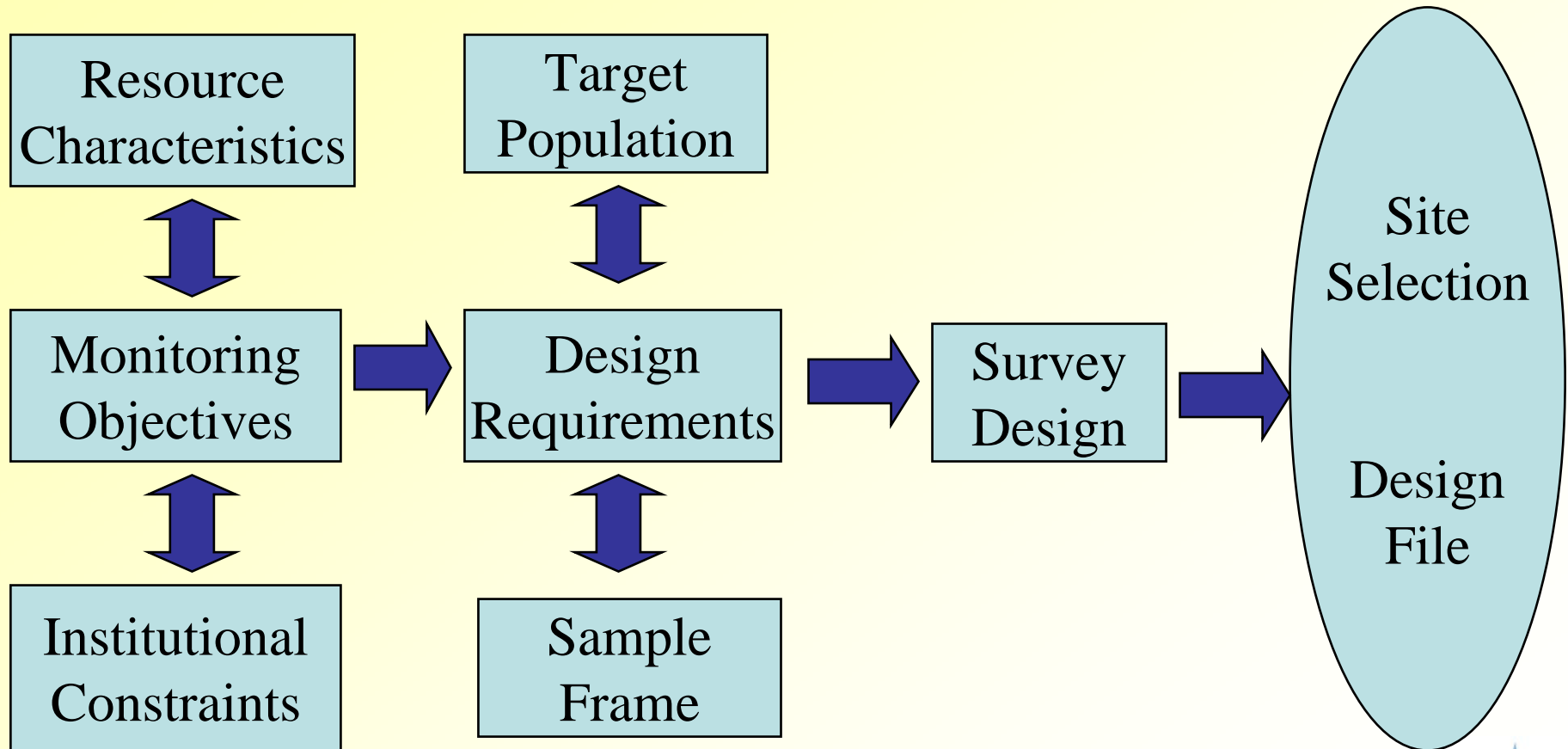
- spatial balance
- variable inclusion probabilities
- stratification
- variable density (for special interest areas)
- nested sub-sampling
- panel designs (for surveys over time)
- over-sampling (to account for frame errors)
- confidence intervals

## **For multiple resource types:**

- discrete resources (lakes; wetlands)
- areal resources (estuaries; large lakes)
- continuous resources (streams and rivers)



# Design Structure



# Ecological Resource Characteristics From Survey Design Perspective

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- **Finite population of discrete entities**
  - 0-dimensional
  - All small lakes in the 48 conterminous states
  - All 8-digit USGS CU in the 48 conterminous states
- **Continuous areal population**
  - 2-dimensional
  - All forest land
  - All coastal estuarine resources
- **Continuous linear network population**
  - 1-dimensional embedded in 2-dimensions
  - All perennial wadeable streams



# Institutional Constraints

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- Budget
- Field crews: location and number
- Separate biological and water quality groups
- Integration of 305(b) and 303(d) monitoring

# Monitoring Objectives

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- Objectives determine the monitoring design
  - Usual to have multiple objectives
  - Objectives compete for samples
  - Precise statements are required
  - Objectives must be prioritized
- Target population and subpopulations are determined by objectives



# What is a Target Population?

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- Target population denotes the ecological resource about which information is wanted
- Requires a clear, precise definition
  - Must be understandable to users
  - Field crews must be able to determine if a particular site is included
- More difficult to define than most expect.
- Includes definition of what the elements are that make up the target population



# Subpopulations and Domains

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- Subsets of the target population that are of particular interest
- Examples for aquatic ecosystems
  - Ecoregions, biogeographic regions
  - All lentic resources in region with area < 100 ha
  - All lotic resources with with Strahler order < 4
  - Tidal creeks versus open water estuarine areas
  - All lotic resources with < 20% riparian canopy cover
  - All 5-th field HUCs with >10 NWI wetland polygons
  - All 6-th field HUCs with >25% Federal land ownership



# Subpopulations: Impact on Design

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- Objectives identify critical subpopulations with expected sample sizes: Domains
- Survey design addresses domain sample size requirements
  - Explicitly using stratification, unequal weighting
  - Implicitly when other requirements provide sufficient sample sizes
- Other subpopulations can not be defined prior to sample selection





# Sample Frame

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- What is it and why is it important
- GIS representation of the target population
- Issues:
  - Overcoverage: includes elements not in target
  - Undercoverage: excludes elements not in target
  - Coding errors
- NHD for streams, lakes, estuaries



# Design Requirements

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- Target population definition
- Subpopulations for which estimates are required
- Unequal weighting categories (eg stream order)
- Sample frame selection
- Sample size
- Single year or multiple year study



# Survey Design Specification

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- Target population definition
- Sample Frame Specification
- Basic Design
  - RTS for areal population
  - GRTS for linear continuous population
  - GRTS for discrete population
  - Simple random sample
- Stratification categories
- Multi-density categories
- Expected sample sizes
- Panel structure
- Oversample specification
- Nested Subsamples
- Intensification domains
- Study-wide base sample
- Multi-Stage or Multi-phase



# Site Selection Process

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- Driven by survey design specification
- Create GIS coverage for boundary of study area
- Create a hierarchical grid covering study area
  - Ensure  $<1$  point per grid cell
  - Ensure grid cell small enough to be included in small regions of study area
- Create GIS coverage for sample frame
- Intersect frame coverage with grid coverage
- Determine multi-density multiplicative factors for unequal probability
- Select sites
- Create Design File



# Design File Contents:

## Has all sites selected by survey design

- Site Identification
  - Site ID
  - Latitude/Longitude
  - Site Name
  - Sample Frame ID
  - County
  - Map names
- Auxiliary Frame Information
  - State
  - Omernik Ecoregion
  - Other
- Survey Design
  - Stratum
  - Multi-Density Category
  - Panel
  - Oversample
  - Nesting Identification
  - Expected Sample Size
  - Initial Weight



# Clean Water Act Questions

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- Do I have a problem and if so how big???
  - What proportion of lakes exceed a particular TP threshold
- Is it getting better or worse???
  - Is the proportion of lakes exceeding TP threshold increasing or decreasing?
- What's causing the problem?
  - What's the relative importance of the stressors associated with the problem? (e.g., point versus non-point sources)



# How do you get started?

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- What is your question? (duh)
- No, really what is your question? (*i.e.*, you need to be able to draw the graph you want to fill in and label the axes)
  - *e.g.*, What is the condition of the nation's lakes? This is a start but not sufficient.
  - How many lakes or what proportion of lakes in the lower 48 states have Secchi visibility below 2 meters?
  - How much of the lake acreage in the lower 48 states has Secchi visibility below 2 meters?
  - 2 different questions requiring 2 different designs.



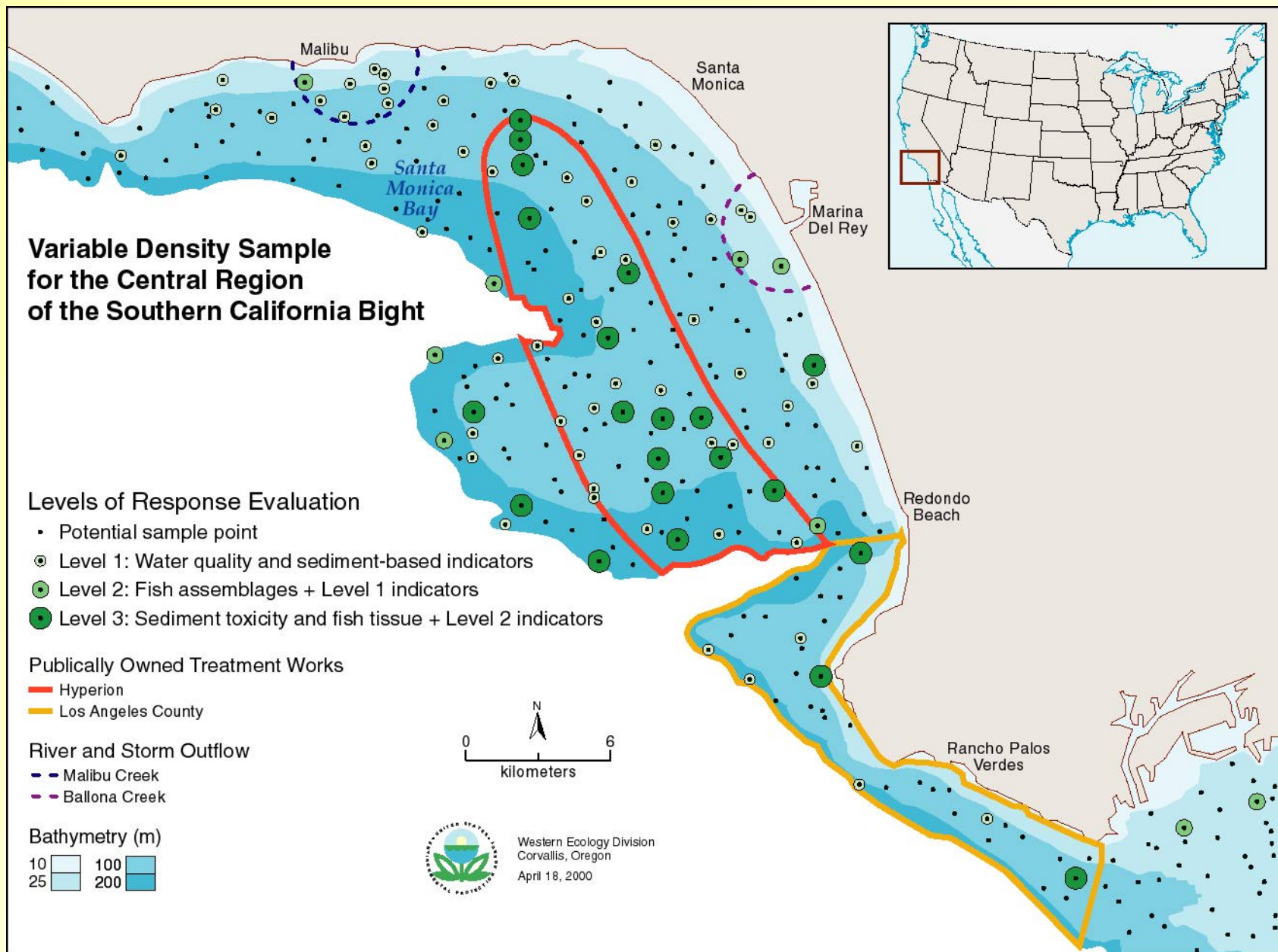
# Additional Planning Questions

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- How do you want to evaluate the results?
- Just one set of numbers for the entire population?
- Are there “sub-populations” that you want to compare?
  - Geographic subpopulations (e.g., east – west)
  - Functional subpopulations (e.g., size, stratified/non-stratified)
  - Only limited by creativity and sample size (aka \$\$\$)
  - Can also “post classify” – can’t guarantee sample size

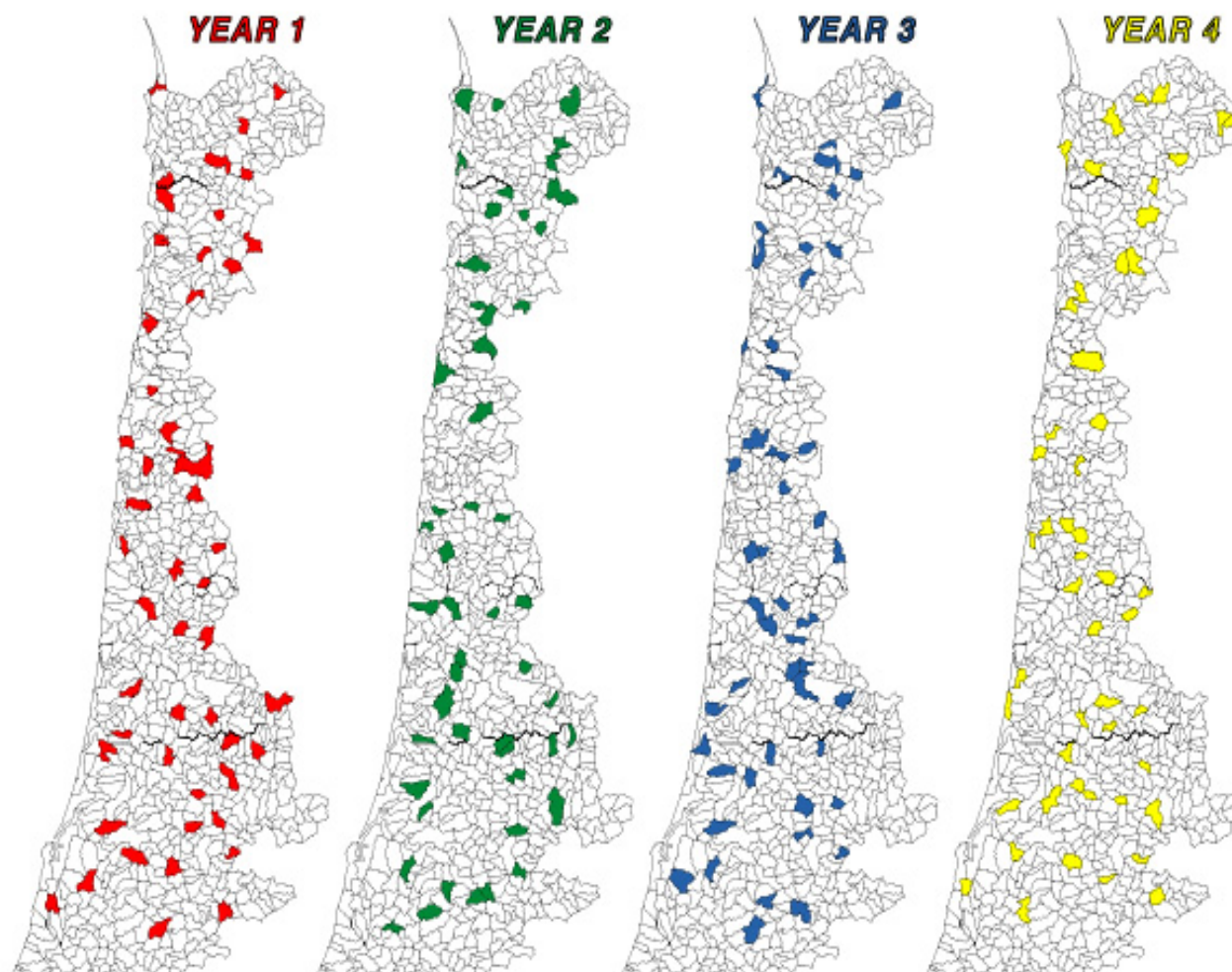


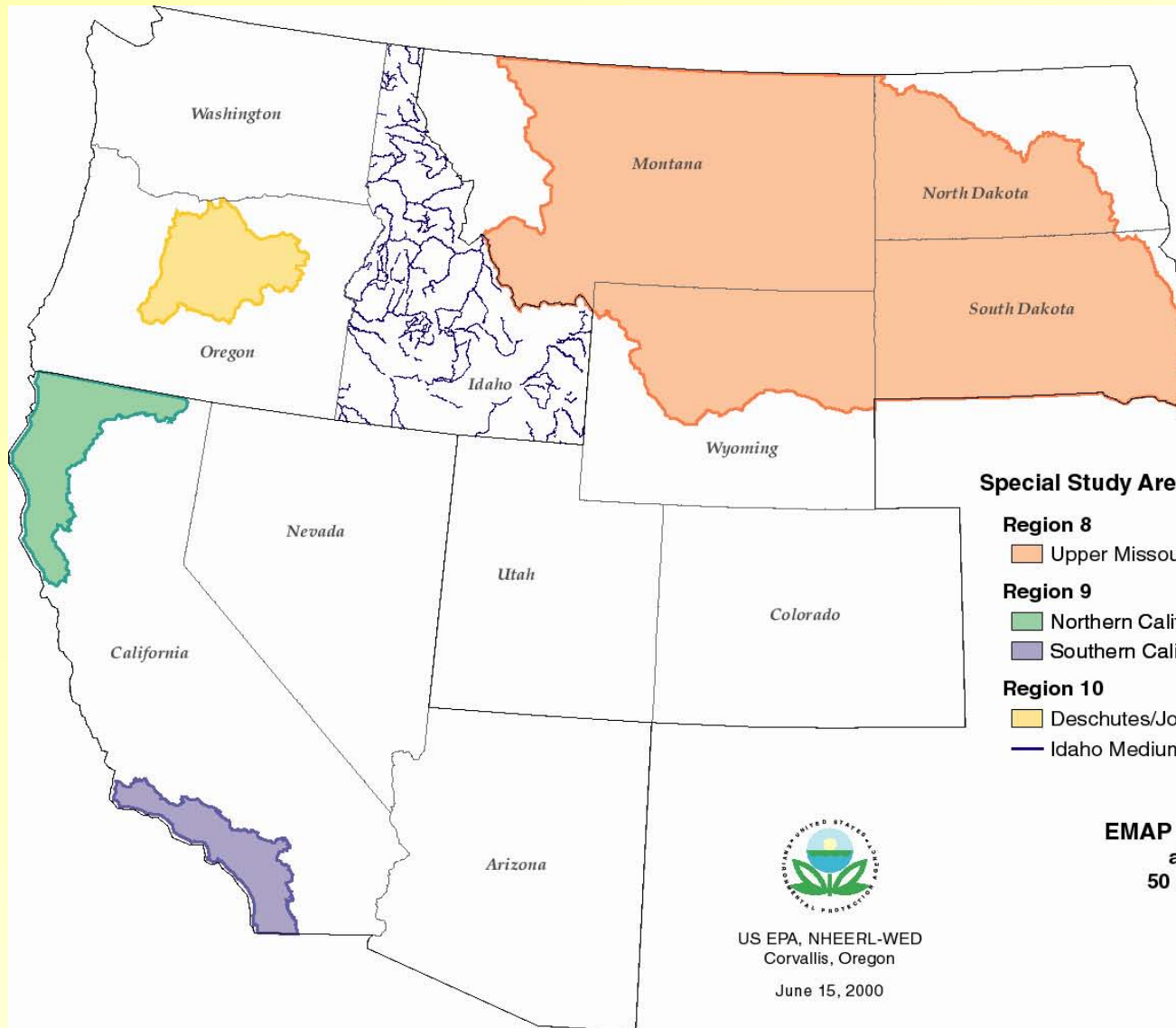




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## Spatially-Balanced Sample of 6-th Field Hydrologic Units Coastal Region of Oregon





# EMAP West Stream and River Survey 1999 - 2004

## Special Study Areas and Number of Field Sites

### Region 8

Upper Missouri River Basin (160)

### Region 9

Northern California Coastal Drainage (160)

Southern California Coastal Drainage (160)

### Region 10

Deschutes/John Day River Basins (160)

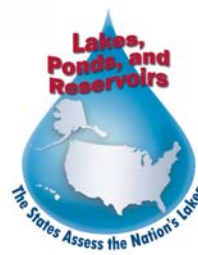
Idaho Medium/Large Rivers (60)

**EMAP West Base Study  
also includes  
50 sites per state.**



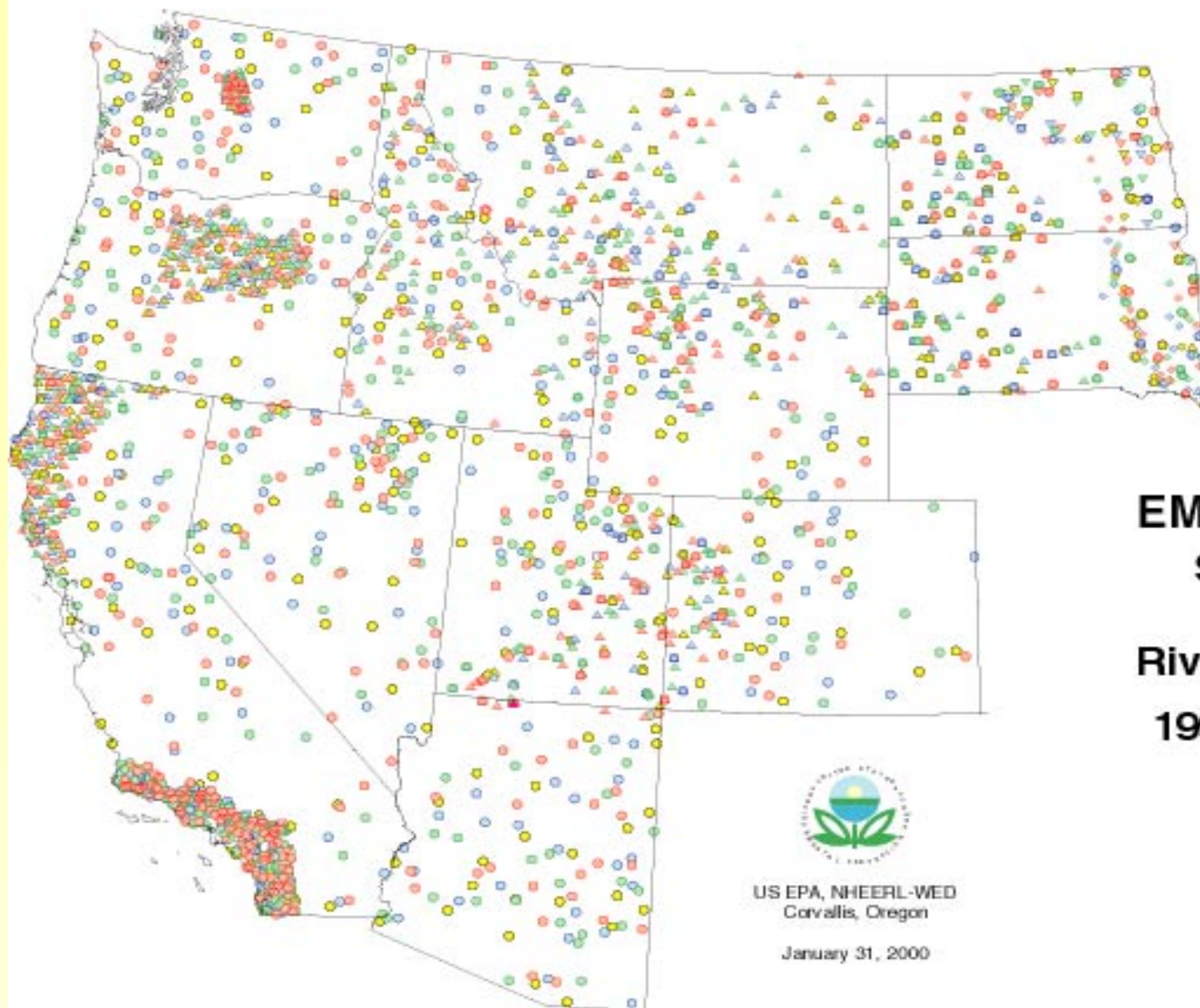
US EPA, NHEERL-WED  
Corvallis, Oregon

June 15, 2000





## RF3 Perennial Potential Sample Sites

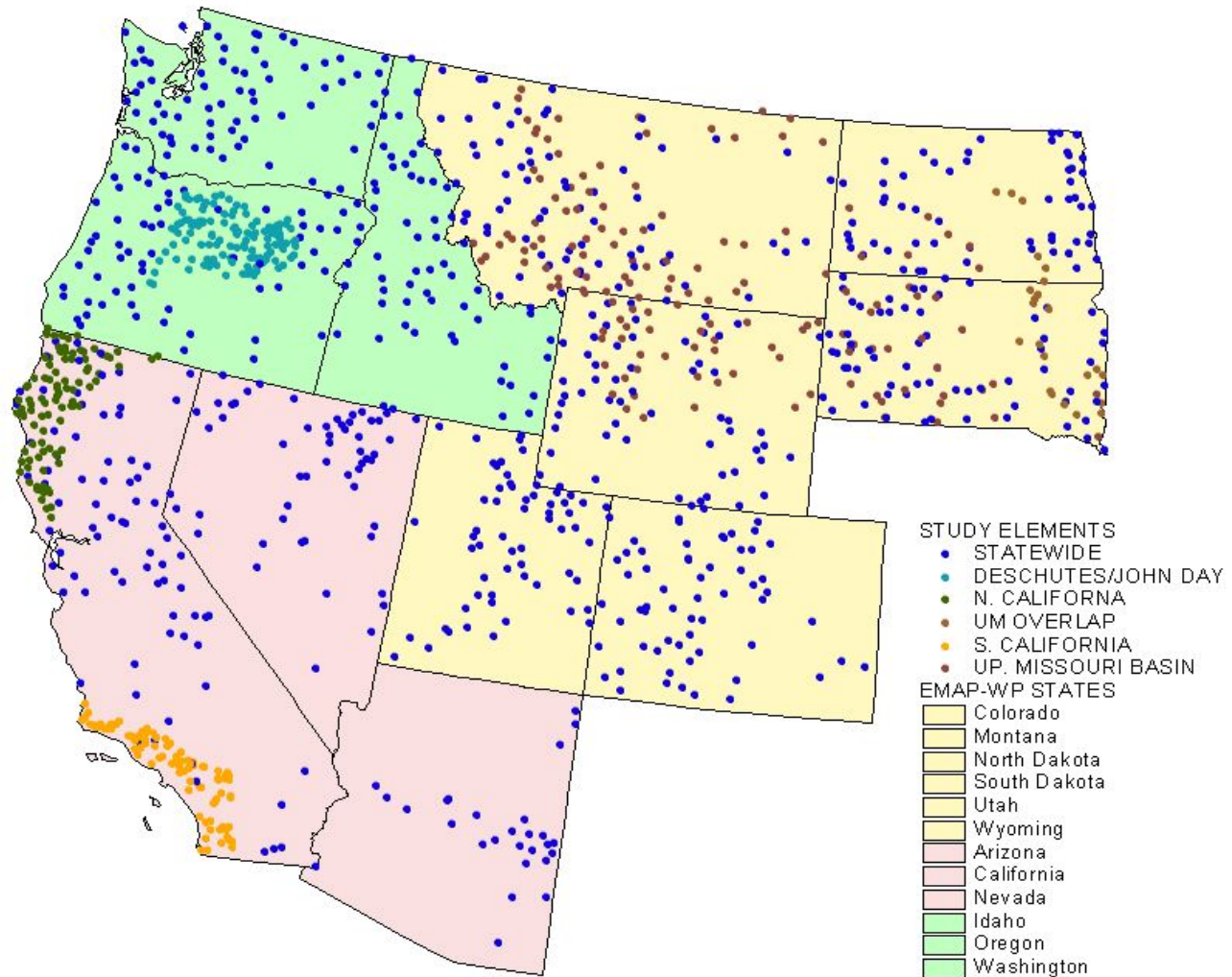


## EMAP West Stream and River Survey 1999 - 2004

- Year 0
- Year 1
- Year 2
- Year 3

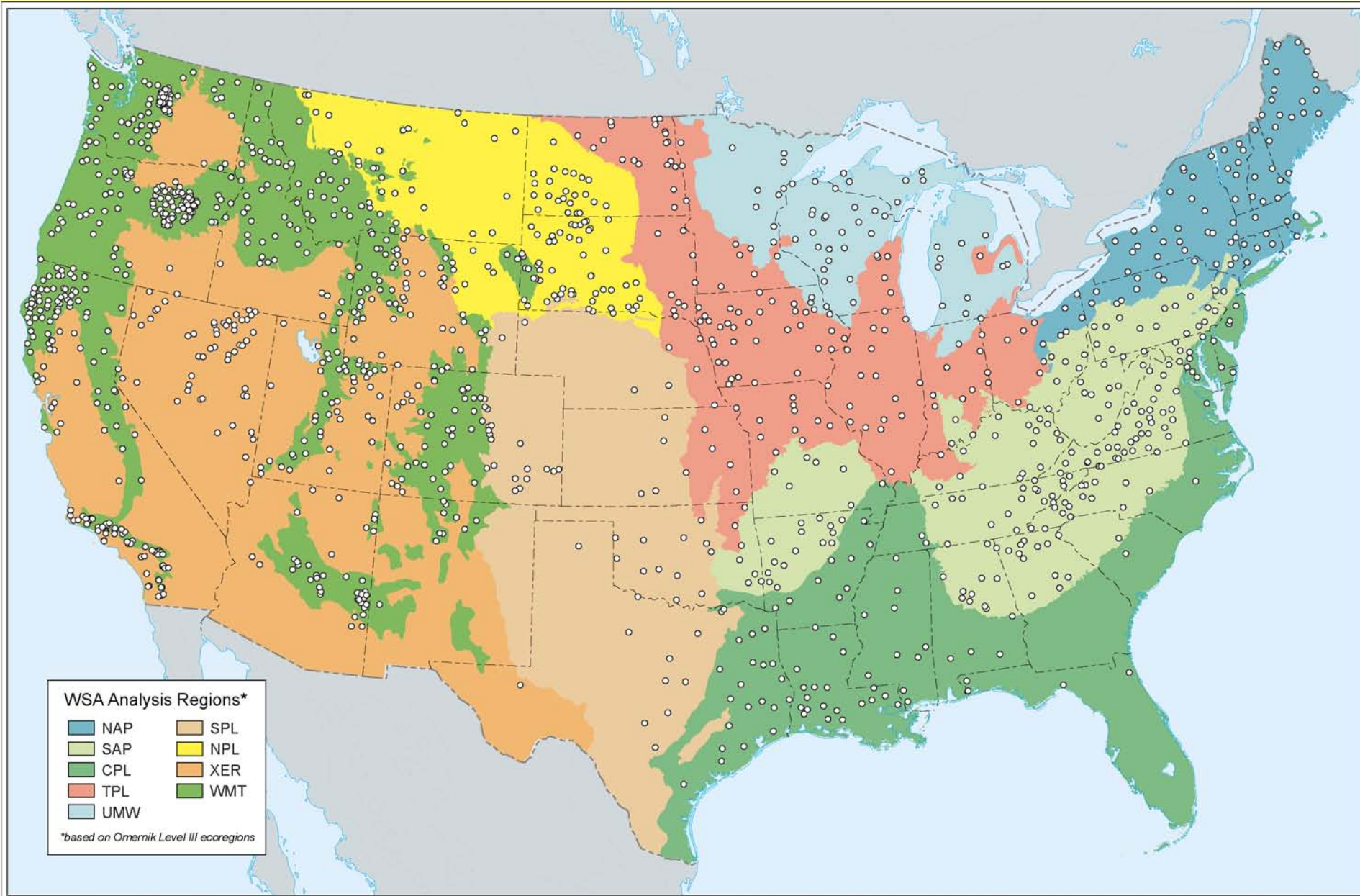


# PRIMARY CANDIDATE SAMPLING SITES: 2000-2003

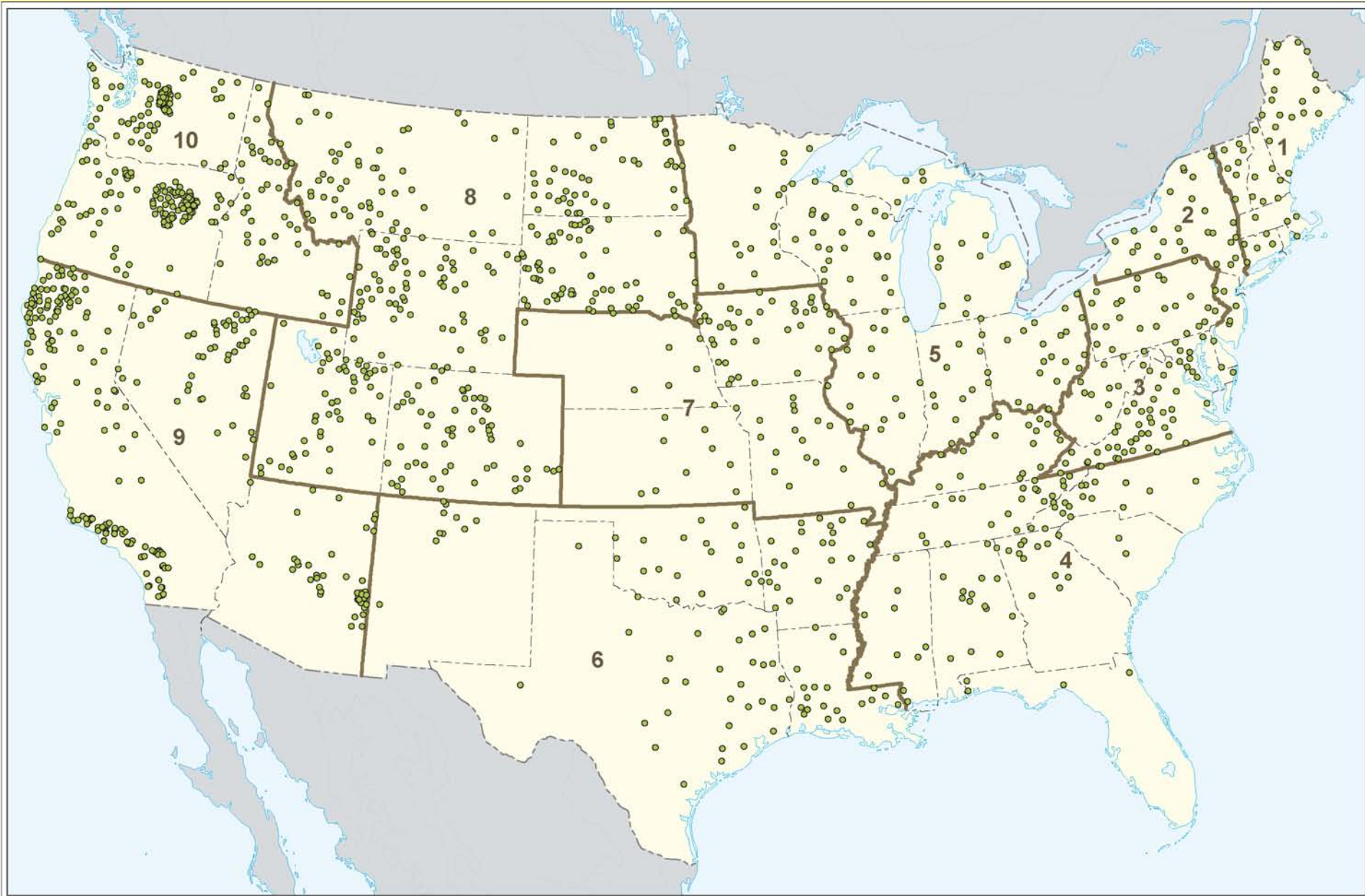




# Examples -Streams

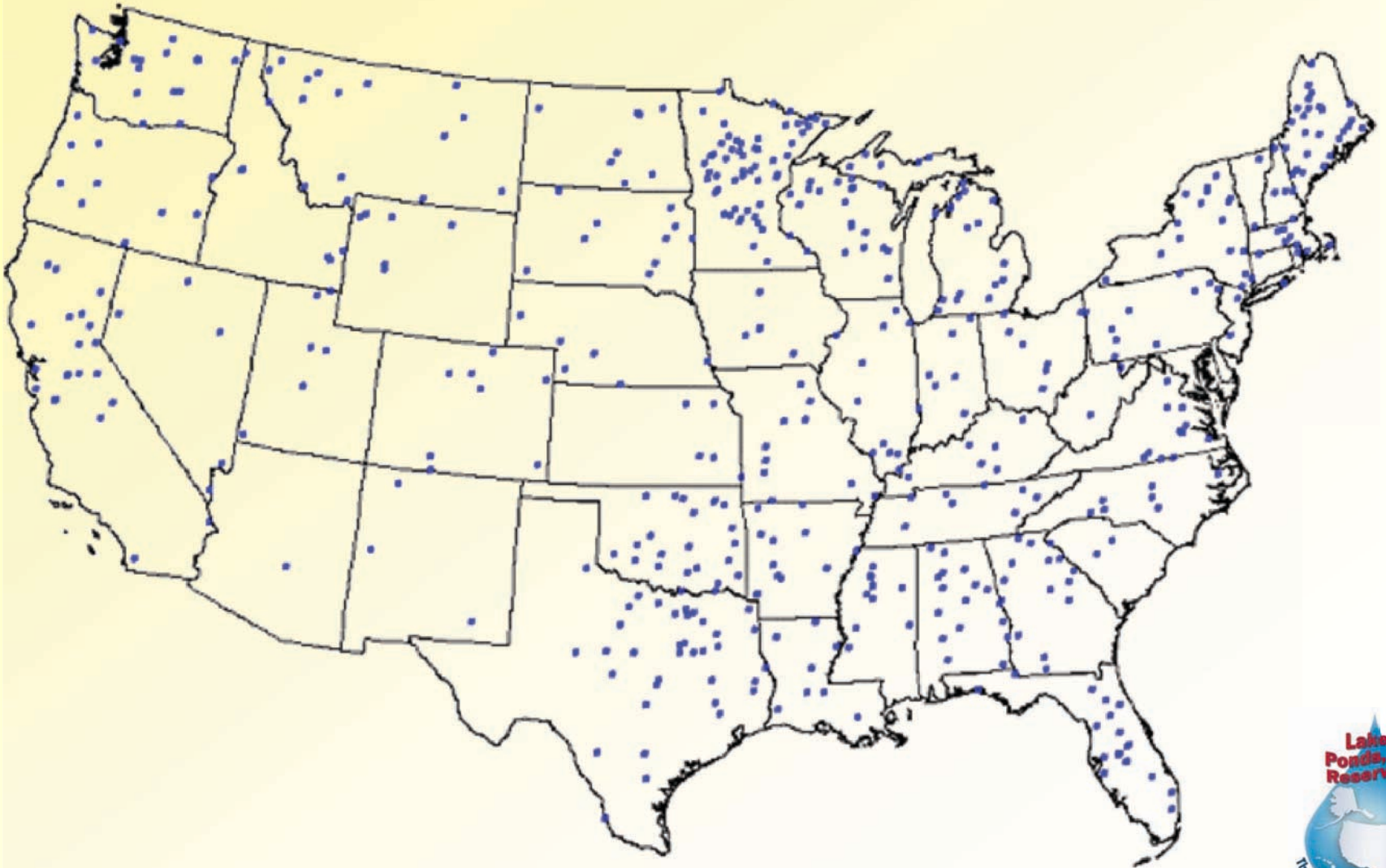


# Examples - Streams



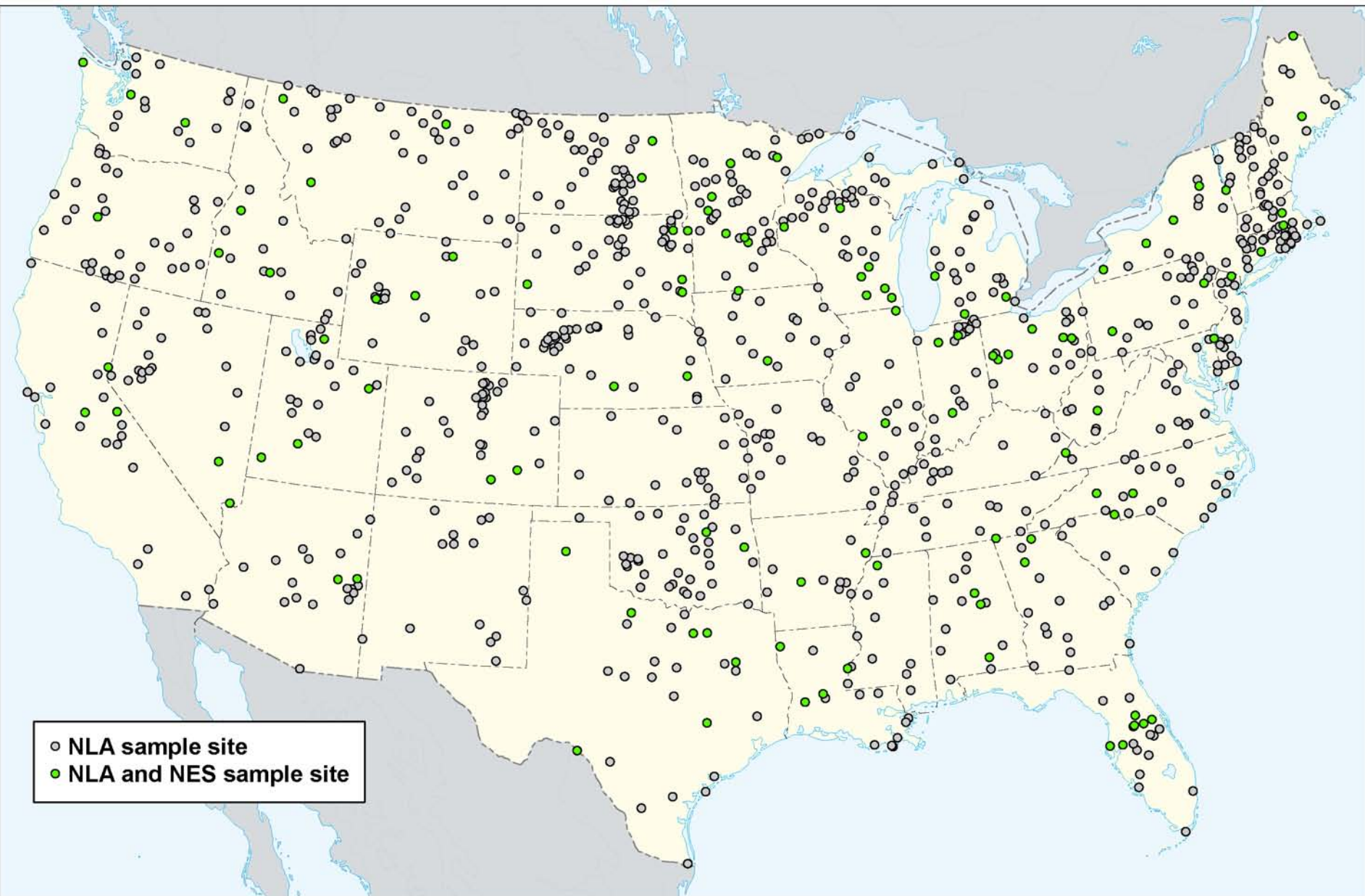


# Examples - Lakes





# Examples - Lakes



# Assessment Flexibility

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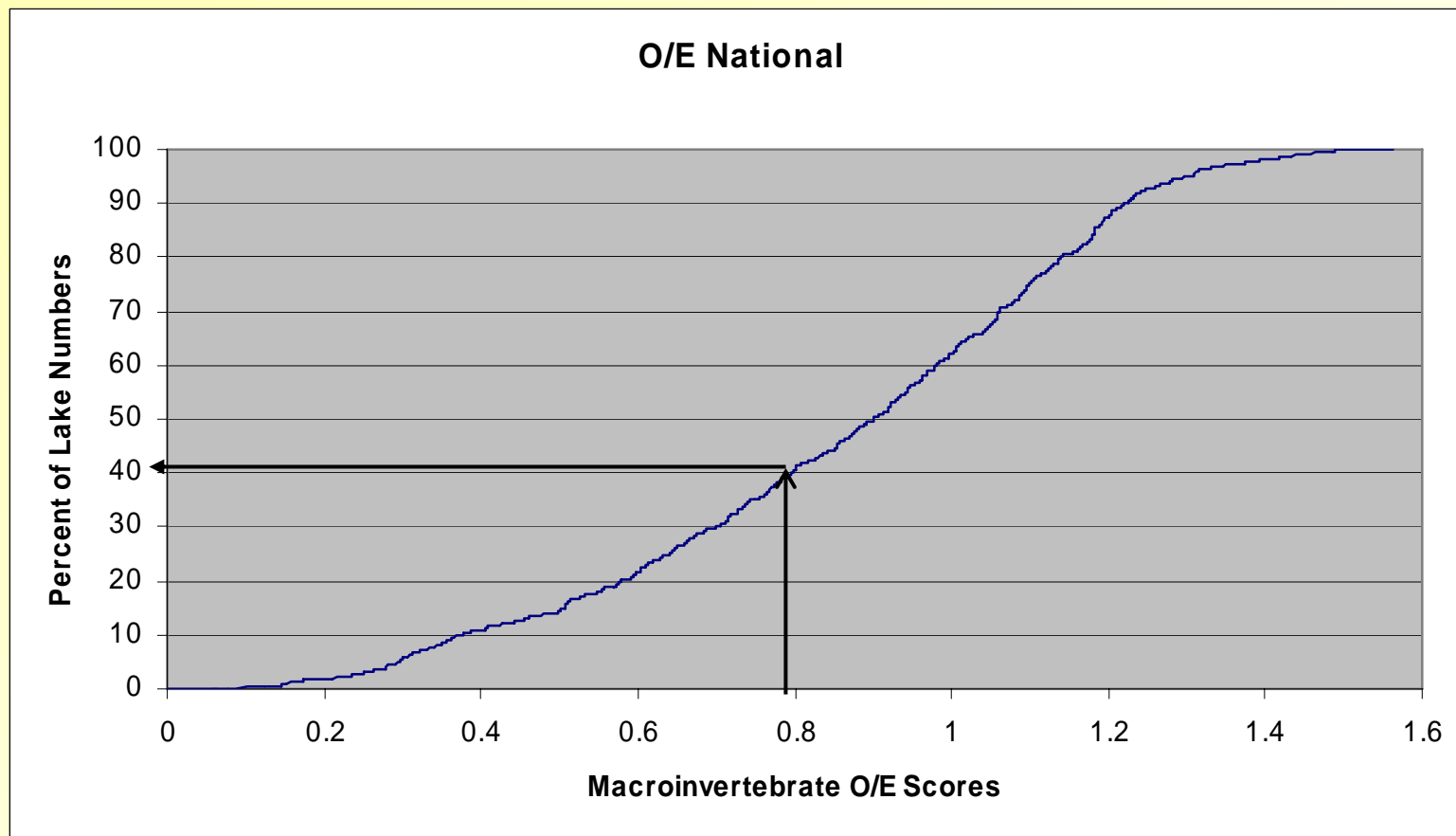
- Design allows post stratification as long as sample size is sufficient
- *e.g.*, Look at changes in particular parameters with various strata of interest – geographic regions, size, landcover, etc.
- Provides a “population” view of upstream-downstream questions
- Answers questions for the CWA and insights into how lakes and reservoirs function



# Information Derived from Survey

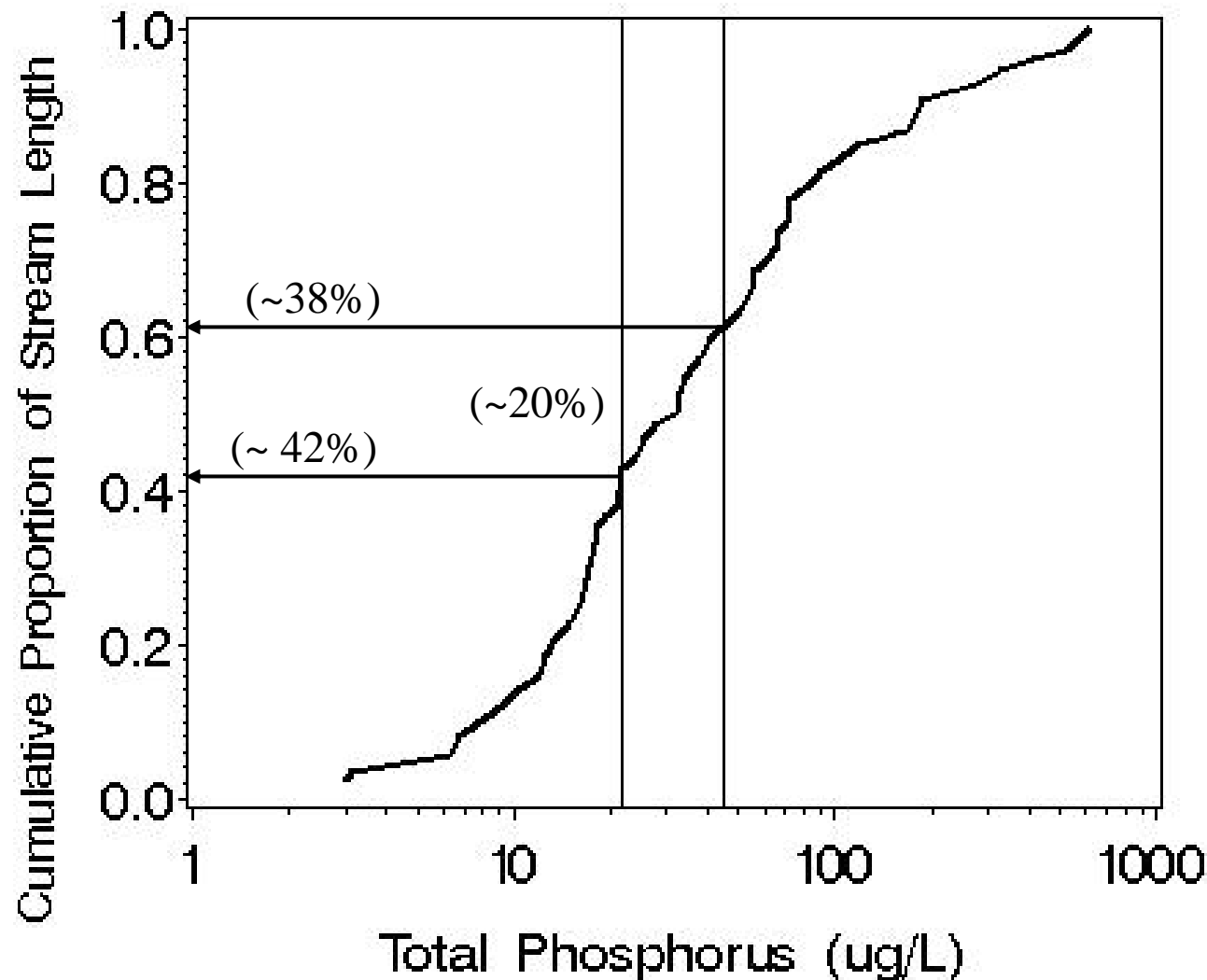
Distribution of Values for Indicator of Interest

Cumulative Distribution Function (CDF)



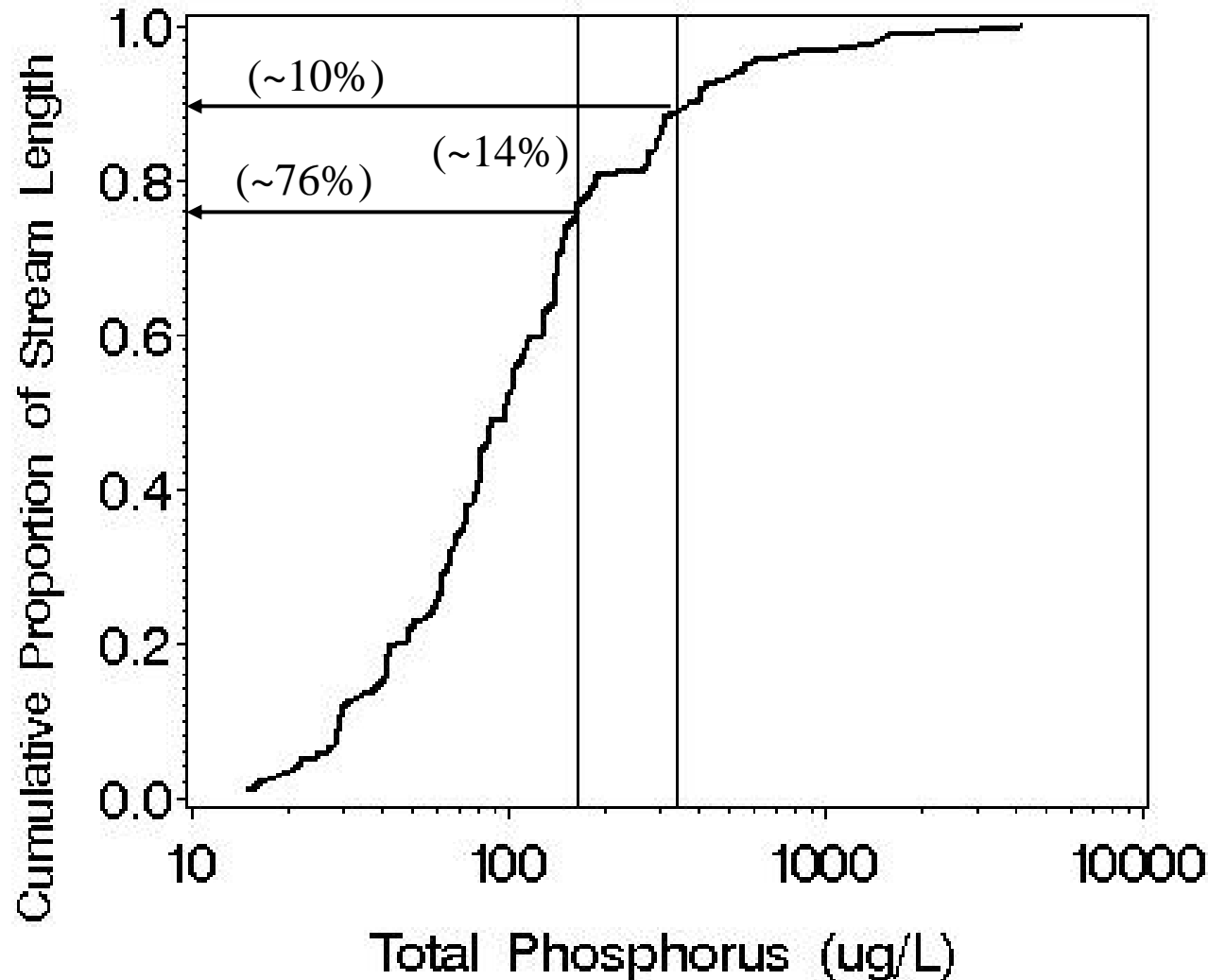
# Nutrient Distribution

WSA/WEMAP National Estimates of Wadeable Stream Condition  
Upper Midwest Aggregate EcoArea



# Nutrient Distribution

WSA/WEMAP National Estimates of Wadeable Stream Condition  
Temperate Plains Aggregate EcoArea



# Sample Size & Uncertainty

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- All estimates come with confidence intervals:
  - e.g., 45% of lakes have TP > 245 ug/l +/- 5%
  - Width of confidence interval driven by sample size
- Sample size of ~ 50-60 yields a confidence interval of +/- 5-8%
- Cutting the confidence interval in half requires a 4x increase in sample size.
- Reporting at multiple scales has sample size implications



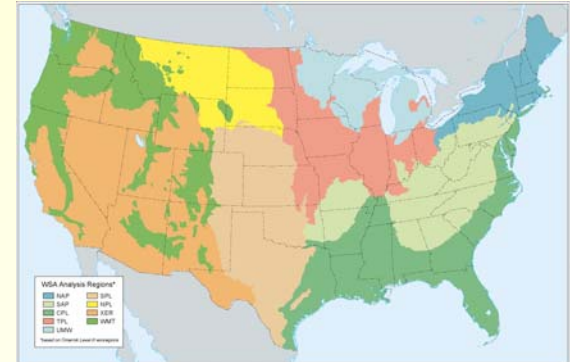
# Sample Size Examples



N ~ 1,300  
Yield CI ~ +/- 2.5%



N ~ 400  
Yield CI ~ +/- 4.6%



N ~ 75 - 150  
Yield CI ~ +/- 7.5%



# More Assistance

## <http://www.epa.gov/nheerl/arm>

Aquatic Resource Monitoring - Microsoft Internet Explorer

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Back Forward Stop Reload Home Search Favorites

Address <http://www.epa.gov/nheerl/arm/> Go Links

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#### Aquatic Resources Monitoring Web Site

Hosted by the  
Monitoring Design and Analysis Team  
USEPA ORD  
National Health and Environmental Effects Research Laboratory,  
Western Ecology Division,  
Corvallis, OR



**Environmental Monitoring and Assessment Program**

This Web site provides information on monitoring of aquatic resources in the US, primarily focused on design and analysis of probability based surveys. Links are provided to other aquatic resources monitoring information available on the internet.

ARM is designed to provide users needing information in several areas:

1. [Introductory, conceptual and overview](#) information on the overall approach, concepts and benefits.
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3. [Technical level](#) information on the design and analysis details, including access to example data sets, results and statistical algorithms.
4. [Implementation](#) Issues, Indicators, and Field Manuals
5. [Presentation](#) and training materials
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7. [Related publications and documents](#) and [program links](#).

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[Introduction](#)

- Aquatic Resource Monitoring has a checkered history of success in providing information and meeting expectations.
- Critical components and the processes for designing, implementing and reporting on aquatic resources are identified.
- Illustrative Processes and Examples provided.

[Design Team](#)

- Presents Team goals and objectives
- Roles and potential services

[Design & Analysis](#)

- Focus is on the probability based designs that have been develop in conjunction with ORD's EMAP Research Program
- Addresses the general principles and background for these designs
- Detailed information to guide development, implementation, analysis and reporting for a sampling survey
- Specific areas of research interests and active research tasks
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Local intranet